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AFAMRL-TR-85-300



A STUDY OF ERROR RATES IN VOICE RECOGNITION

JENNIFER S. BALLMAN

AIR FORCE AEROSPACE MEDICAL RESEARCH LABORATORY

FEBRUARY 1985

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AFAMRL-TP-85-300

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FOR THE COMMANDER

CHARLES BATES, JR.

Director, Human Engineering Division

Air Force Aerospace Medical Research Laboratory

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UNCLASSIFIED								
28. SECURITY CLASSIFICATION AUTHORITY			3. DISTRIBUTION/A	- -				
26. DECLASSIFICATION/DOWNGRADING SCHEDULE			Approved for public release; distribution unlimited					
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PREFACE

This research was conducted while the author was a University of Dayton student cooperative at the Air Force Aerospace Medical Research Laboratory, Wright-Patterson Air Force Base, Ohio. The author gratefully acknowledges the support and contributions of Ms. Sharon Ward, Capt David Leupp, and MSgt Danny Bridges.

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INTRODUCTION

Complex man-machine systems are often limited by comparatively slow and inefficient data entry methods. The recent proliferation of computer peripherals, such as trackballs, "mice", touch screen displays, digitizing panels, and voice command systems attests to this problem. The most complex solution, voice recognition, is also the most attractive because speech is the richest and most natural way for people to communicate. Machines are available that decipher phonetic patterns into text with over 90% accuracy, but in critical situations, even a small number of errors can significantly degrade performance. It is therefore of interest to identify words that are consistently unintelligible or mistaken for other words, and avoid their use in voice command systems. The Data Entry Vocabularies in a C³ Environment study (DEVICE) was performed during December 1983-January 1984 and used a vocabulary from a prior AFAMRL experiment to investigate error rates. The results are presented here.

BACKGROUND

During the SIMCOPE-1 study, performed by Dr. Peter Crane (Univ. of Pittsburgh) and Capt Dave Leupp (AFAMRL/HEC)¹, which incorporated voice command as one of two data entry methods in a simulated missile warning crewstation, several "problem" words emerged. A pilot study to find word recognition error rates for the entire SIMCOPE-1 vocabulary produced more candidate words. Replacement words with meanings similar to the problem words were chosen for phonetic dissimilarity and combined with the original list of 95 words, giving a total of 125 words.

EXPERIMENTAL DESIGN

The experimental vocabulary contains three groups of words (Table 1), the control group (words which caused few errors, totalling 65), the original group of problem words (totalling 30), and the replacement group (totalling 30). Two vocabularies were used: control and original (V1), and control and replacement (V2). Ten subjects from a subject pool were trained on the voice recognition equipment. All 125 words were repeated ten times to allow the machine to "learn" the pronunciation of the word, and then this information was stored on tape. The system used was speaker-dependent, requiring a different tape for each subject. Training was supervised by the experimenter, who coached the subjects to avoid monotonous pronunciation. (Since word inflection is invariably different during training than during use, the processor, which averages the training pronunciations, will recognize words better if various inflections are used during training.)

During a session, a subject was seated in a soundproof room in front of a terminal, wearing a head-mounted microphone. Microphone placement has been shown to be an important factor in recognition,^{2,3} so placement was supervised during training and trials. The trial was initiated by the subject and consisted of three randomly ordered iterations of V1 or V2, with each word flashing onto the screen at random intervals (1-3 sec) and remaining on the screen for .35 sec. The subject attempted to read the word into the microphone before the next word appeared. Time stress was present to simulate a more realistic setting, and to prevent the subject

from lapsing into a monotone (yet few subjects skipped words because of it). Subjects could interrupt the experiment at any time and had two mandatory breaks per trial. Sessions lasted approximately 25 minutes, consisting of two trials separated by a five-minute break, for a total of five breaks. Each session included one trial of V1 and one of V2 in varying order. The session order for subjects is shown in Table 2. Audio tapes of the sessions were made.

Equipment used included a Threshold 600 voice recognizing unit, a Shure SM10A head-mounted microphone worn by the subjects, a DEC PDP 11/40 mini-computer that presented trials and collected data, and a Tascam 44 audio tape recorder.

RESULTS

Two types of errors were recorded, misrecognition, or confusion with another word, and nonrecognition, or failure of the system to match the word with the training pattern. Nonrecognitions can be frustrating to a user (especially with the usual audible feedback), but misrecognitions are more dangerous to system performance because they can go undetected.

The error rates for each group are shown in Table 3. It is clear that the intuitive criteria used to select the replacement group did not result in a superior vocabulary. In fact, the replacement words had a significantly higher misrecognition rate (χ^2 = 6.00, p < .05). One possible reason might be that many of the subjects, drawn from a limited pool, had unavoidedly been subjects for the SIMCOPE-1 study and were more familiar with the original words (V1). Table 4 shows the word replacement pairs, each having one original and one replacement word, for which error rates differed significantly. The overall error rate of the best words from each pair was 6.4%, compared with 18.5% for the worst words.

A closer examination of Table 4 and the least recognized words (Table 5) allows some hypotheses to be made based on phonetic qualities of "problem" words:

- 1. Monosyllabic words are less often recognized than polysyllabic words.
- 2. Words ending with T or containing a T which is slurred or absent in normal speech (eight, west, delta) are also poorly recognized.

Table 6 illustrates the breakdown of the vocabulary into these two groups. The actual number of high-error words in a phonetic group was compared with the expected number, or the number of words in a group multiplied by the overall probability of error over 10% (39/125) (Table 7). Vocabulary words that belonged to either of these groups were significantly more likely to have an overall error rate greater than 10%. Words that belonged to both groups made too small a sample to have a significant difference in rate. It is clear that these word groups should be avoided by system designers especially because words belonging to neither group were highly unlikely to have an error rate over 10%.

TABLE 1. DEVICE Word List

والمرابط فالمرابط والمتاريخ والمتاريخ والمتاريخ والمتاريخ والمتاريخ والمتاريخ والمتاريخ والمتاريخ والمتاريخ والمتاريخ

CONTROL

YES INDISTINCT **EVENT MESSAGES** NO CDC SYSTEM REPORTS NORTH CWC TELEPHONE DIRECTORY SOUTH **BSS** DETAIL MAP CENTRAL KEY NORTH EVENT TIMELINE INN NORTH CITY INTELLIGENCE REPORTS OUTT TOLL CITY OUTPUT FORMAT

WEST HAYES REFERENCE DIRECTORY SUSPECTED **CLEAR** ADS1 **ZERO ASSIGN** ADS2 ONE BACKSTEP CLEAR ENTRY

TWO **AUTO ADS**

THREE EDIT KNOWN SITES

FOUR WHITE SANDS MILITARY INSTALLATIONS FIVE PINE GROVE INDUSTRIAL CENTERS

SIX SOUTHRICH ALL EVENTS SEVEN

HOSTILE ALL TEST EIGHT ADS GSF NINE REASSIGN BSS GSF ENTER SHOW OCEAN CITY TYPE I **SUPPRESS** VECTOR

TYPE II SITUATION MAP

ORIGINAL

KNOWN UP ARROW **E7** UNKNOWN DOWN ARROW **E8** FINISH LEFT ARROW E9 BURF RIGHT ARROW E10 RIVERTON NOT CLEAR E1

LIVINGSTON **E2** LOCATE **DELTA E3** LOG

SOUTHERN E4 SUSPECT SITES SEND **E5** DELETE

ACKNOWLEDGE E6 FAN

REPLACEMENT

IDENTIFIED SCROLL UP EVENT 7 UNIDENTIFIED SCROLL DOWN **EVENT 8** OVER SCROLL LEFT EVENT 9 BRF SCROLL RIGHT EVENT 10 ROSEDALE EVENT 1 UNRESOLVED EVENT 2 LAKEVIEW COORDINATES DAIRYLAND EVENT 3 MESSAGE LOG MOUNTAIN EVENT 4 POSSIBLE SITES

SUBMIT EVENT 5 REMOVE OK EVENT 6 RANGE

TABLE 2. Experimental Design

SUBJE	СТ	SESSION							
#	TRIAL	1 2 3 4 5							
1	1 2	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1		
2	1 2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2		
3	1 2	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1		
4	1 2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2		
5	1 2	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1		
6	1 2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2		
7	1 2	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1		
8	1 2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2		
9	1 2	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1		
10	1 2	V2 V1	V1 V2	V2 V1	V1 V2	V2 V1	V1 V2		

TABLE 3. Error Rates of Word Groups

Overall Error Rate Control Error Rate Original Error Rate Replacement Error Rate	= 8.75% = 8.72% = 8.67% = 8.90%
Misrecognitions	= 2.00%
Control	= 1.74%
Original	= 1.93%
Replacement	= 2.63%
Nonrecognitions	= 6.75%
Control	= 6.98%
Original	= 6.74%
Replacement	= 6.27%

TABLE 4. Word Pairs With Significantly Different Error Rates (Total Number of Trials Per Word Group = 180) (p(χ^2), p < .05)

OVERALL ERRORS

ORIGINAL	# ERRORS	REPLACEMENT	# ERRORS
BURF	53	BRF	10
DELTA	34	DAIRYLAND	16
SOUTHERN	21	MOUNTAIN	54
DOWN ARROW	11	SCROLL DOWN	24
E4	13	EVENT 4	27
<u>E9</u>	6	EVENT 9	15
Elø	.5	EVENT 10	16
DELETE	44	REMOVE	17
FAN	33	RANGE	7
		MISRECOGNITION ERRORS	
KNOWN	5	IDENTIFIED	17
UNKNOWN	ĭ	UNIDENTIFIED	14
FINISH	9	OVER	Ø
SEND	7	SUBMIT	Ø
LEFT ARROW	7	SCROLL LEFT	1
E4	Ø	EVENT 4	11
<u>F5</u>	3	EVENT 5	10
E8	13	EVENT 8	29
E8 E9	2	EVENT 9	10
ElØ	1	EVENT 10	8
LOCATE	Ø	COORDINATES	4
SUSPECT SITES	5	POSSIBLE SITES	Ø
DELETE	6	REMOVE	Ø
FAN	6	RANGE	Ø
		NONRECOGNITION ERRORS	
KNOWN	32	IDENTIFIED	13
UNKNOWN	24	UNIDENTIFIED	6
FINISH	9	OVER	25
BURF	53	BRF	8
DELTA	33	DAIRYLAND	15
SOUTHERN	11	MOUNTAIN	45
DOWN ARROW	9	SCROLL DOWN	24
DELETE	38	REMOVE	17
FAN	19	RANGE	7

(best word underlined)

TABLE 5. Words With Overall Error Rates Greather Than 10%

Overall Error Rate	Words
11%	INDISTINCT, SOUTHRICH, SHOW, INTELLIGENCE REPORTS, ADS GSF, UNIDENTIFIED
12%	SOUTHERN, LEFT ARROW, SUPPRESS
13%	EDIT, SCROLL DOWN
14%	NO, CENTRAL, WEST, UNKNOWN, TWO, NINE, E8, OVER, SCROLL UP, SCROLL LEFT
15%	OUTPUT FORMAT, EVENT 4
17%	SEVEN, IDENTIFIED
18%	FAN
19%	YES, DELTA
20%	FOUR, EVENT 8
21%	NORTH, SOUTH, OUTT, KNOWN, EIGHT
22%	INN
24%	DELETE
29%	BURF
30%	MOUNTAIN

TOTAL = 39 Words

TABLE 6. Phonetic Groups in Vocabulary

	FINAL OR	
MONOSYLLABLES	VESTIGAL T	BOTH
*YES	ENTER	*OUTT
*NO	*INDISTINCT	*WEST
*NORTH	RIVERTON	*EIGHT
*SOUTH	*DELTA	TEST
*INN	RIGHT ARROW	
*KNOWN	AUTO	TOTAL = 4
ONE	*EDIT	
*TWO	*E8	
THREE	LOCATE	
*FOUR	*OUTPUT FORMAT	
FIVE	SUSPECT SITES	
SIX	*DELETE	
*NINE	*IDENTIFIED	
*BURF	*UNIDENTIFIED	
CLEAR	*SCROLL LEFT	
SEND	SCROLL RIGHT	
*SHOW	EVENT 1	
LOG	*EVENT 8	
ALL	*MOUNTAIN	
*FAN	SUBMIT	
RANGE		
	TOTAL = 20	
πΩτλι. = 21		

^{*}over 10% error rate

TABLE 7. Comparison of Error Rates of Phonetic Groups

Word Group	Total #	# With < 10% Errors		# With > 10% Errors		χ^2	Sig.
		Act.	Exp.	Act.	Exp.		
Monosyllables	21	9	14.4	12	6.55	6.44	<.05
Final or Vestigial T	20	9	13.8	11	6.44	5.28	<.05
Both	4	1	2.75	3	1.25	3.56	-
Neither	8Ø	67	55.0	13	25.0	8.38	<.005
							
TOTAL	125	86		3	9	-	-

Other effects of phonetic structure on word recognition probably exist which were not detectable in this vocabulary, lacking as it is in size and diversity. Further research into the phonetic factors that affect machine intelligibility is needed.

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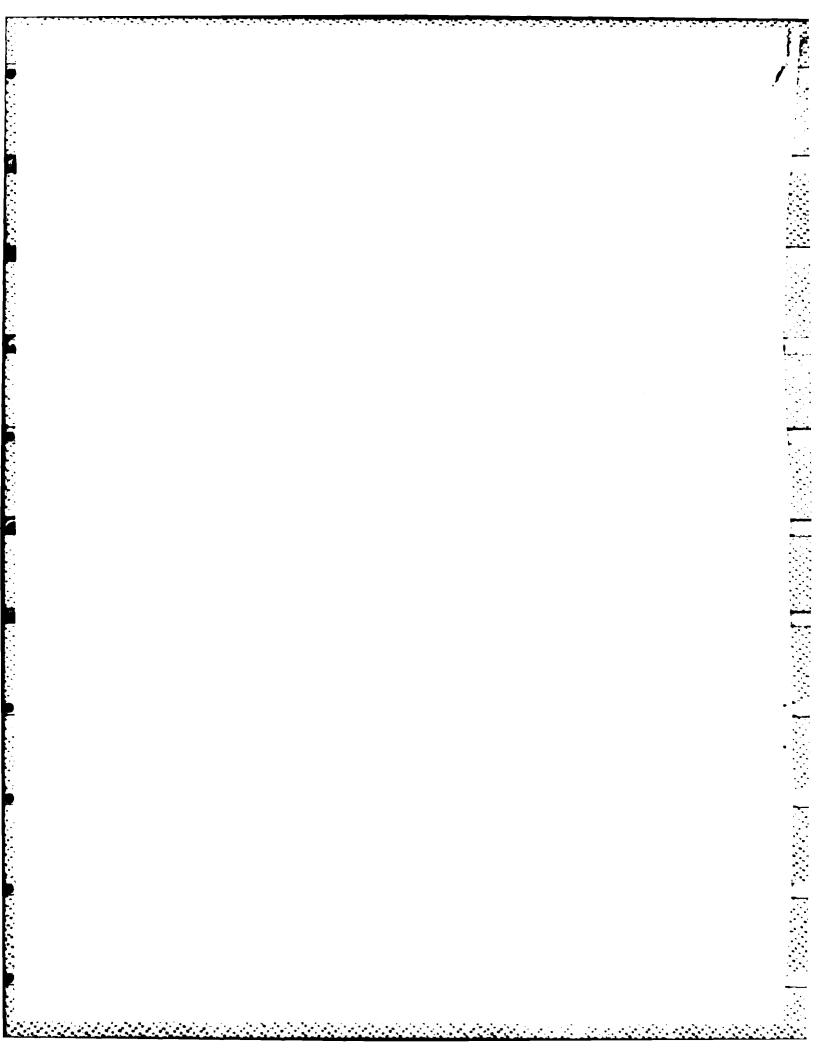
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